Learning Based Cross-Coupled Control for Multi-Axis High Precision Positioning Systems

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ABSTRACT
In this paper, a controller featuring cross-coupled control and iterative learning control schemes is designed and implemented in a modular two-axis positioning system in order to improve both contour and tracking accuracy. Instead of using the standard contour estimation technique proposed with the variable gain cross-coupled control, a computationally efficient contour estimation technique is incorporated with the presented control design. Moreover, implemented contour estimation technique makes the presented control scheme more suitable for arbitrary nonlinear contours. Effectiveness of the control design is verified with simulations and experiments on a two-axis positioning system. Also, simulations demonstrating the performance of the control method on a three-axis positioning system are provided. The resulting controller is shown to achieve nanometer level contouring and tracking performance. Simulation results also show its applicability to three-axis nano-positioning systems.

INTRODUCTION
Increasing demand for micro/nano-technology related equipment resulted in a growing interest for precision positioning. Multi-axis precision positioning is required in micro/nano-scale manufacturing and assembly, optical component alignment systems, scanning microscopy applications, nano-particle placement applications, cell/tissue engineering and etc. [1-3]. Most of the time, these applications require both high contour and tracking accuracy.

In tracking control, the objective is moving along a desired trajectory. Although almost all systems employ feedback as a part of tracking control, substantial improvement of tracking accuracy is achieved by the addition of feed forward control methods. In literature, several feed forward control schemes have been shown to improve tracking accuracy such as zero phase error tracking control (ZPETC) [4-6], feed forward friction compensation [7,8] and iterative learning control (ILC) [9,10]. According to Tomizuka [4], tracking performance of a ZPETC system is sensitive to variations in plant parameters and modeling errors since ZPETC design is based on pole/zero cancellation and phase cancellation. Moreover, friction compensation techniques generally incorporate a system identification process that should be repeated if system parameters change. On the other hand, Tan et al. [9] claims that specifying a plant model for ILC via zero phase filtering is not necessary considering the principle of self-support that is argued in [11] because the stored control signals reflect the plant characteristics. In other words, ILC can improve tracking performance of a system even the plant structure and nonlinearities are unknown [12]. Yet, the system should execute the same task repetitively to be able to implement an ILC scheme.

Generally, improving tracking accuracy of each individual axis also increases contouring accuracy of the multi-axis system. However, in some cases, decreasing the tracking error may not decrease the contour error; it may even deteriorate the
contouring performance [13]. Hence, control structure should be designed considering not only tracking error but also contour error in order to achieve high accuracy in both. Koren [14] proposed the cross-coupled control (CCC) that focuses on eliminating contour error rather than individual axes errors. This method is proven to reduce contour error significantly. Since the introduction of CCC, it has been modified and combined with different control techniques. Some examples are observer-based CCC [15], cross-coupled model reference adaptive control [16], cross-coupled iterative learning (CCILC) [10], CCC with disturbance observer and ZPETC [6], CCC with friction compensation [8] and CCC with ILC [10, 17].

Since CCC based control schemes require contour error as the control parameter, there is a need for construction of a contour error model in real time. Contour error is defined as distance between actual position and the nearest position on the contour [18]. Although, contour error can be calculated for linear contours, this calculation is very complicated for nonlinear contours, especially during the operation. Hence, some approximations have been used to calculate a nonlinear contour error. Koren [13] suggested circular contour assumption. Then, Yeh and Hsu [18] proposed a method to approximate contour error as the vector from the actual position to the nearest point on the line that passes through the reference position tangentially. As the authors mentioned, although circular contour assumption works well for biaxial motion systems, it is difficult to apply on multi-axis systems.

The work presented aims to provide an improved method for precision motion control featuring CCC and ILC. Although CCC and ILC have been used together in [10] and [17] for contours combining lines and circles, the new method also benefits from the contouring error estimation vector approach. In this way, the new method is computationally more efficient, more suitable for coupling gain calculations of arbitrary nonlinear contour and easier to implement on multi-axis systems. Moreover, for the best of our knowledge, this is the first time CCC and ILC is used together to achieve nanometer level precision and implemented on a three-axis system.

SYSTEM SETUP
The two-axis positioning system is constructed by assembling two modular single-axis stages perpendicularly as in Fig. 1. A modular single-axis stage is designed with a stationary base and a moving slider that are connected to each other via cross-roller linear bearings. The stage is actuated by a brushless permanent magnet linear (PMLM) motor with 120mm travel range whereas the position feedback is taken from an incremental linear encoder. The linear encoder has an optical scale with four micrometer grating in pitch leading one micrometer resolution. Yet, the encoder resolution is increased to 25 nanometers using an interpolation technique. Details of interpolation procedure can be found in [19].

Idealized dynamic model of a single-axes linear stage is given in Fig. 2 where $R$ is linear motor resistance, $L$ is linear motor inductance, $K_{BEMF}$ is back electromotive constant, $K_{force}$ is force constant, $m$ is sliding mass, $b$ is viscous friction, $e$ is linear motor input voltage, $K_{amp}$ is amplifier gain and $i$ is linear motor current. In the dynamic model, ripple forces of the PMLM are neglected and linear bearings are modeled as viscous friction component. From the dynamic model, mathematical model of the linear stage is found as in Eq. (1).

$$G(s) = \frac{X(s)}{E(s)} = \frac{K_{amp}K_{force}}{s[Lms^2 + (Rm + bL)s + (Rb + K_{BEMF}K_{force})]}$$

After the system is modeled, a suitable PID feedback controller is obtained using traditional methods.

CONTROL DESIGN
In this paper, an improved method based on CCC and ILC which benefits from the contouring error vector approach has been presented. Next two subsections will briefly describe ILC scheme used in this work and CCC. Moreover, contour estimation approaches will be explained together with CCC. The last subsection will mention the insight of the improved method.

Iterative Learning Control (ILC) via Zero Phase Filtering
ILC is a technique for improving the transient response of a system that operates repetitively. ILC can often be used to achieve perfect tracking, even when the model is uncertain or unknown and there is no information about the system structure and nonlinearity [12]. ILC based on zero phase filtering is a practical and efficient implementation of ILC [9].
Block diagram of ILC via zero phase filtering for an individual axis is given in Fig. 3. In the diagram, superscript $i$ is iteration number whereas $u_{ff}^{i}$ and $u_{fb}^{i}$ are feed forward and feedback control signals at $i^{th}$ iteration. The feed forward control signal for $i^{th}$ iteration is calculated using the feed forward and feedback control signals of the previous iteration that are shown as $u_{ff}^{i-1}$ and $u_{fb}^{i-1}$ respectively. The learning update law can be given as in Eq. (2) [9].

$$u_{ff}^{i}(k) = u_{ff}^{i-1}(k) + \frac{\gamma}{2M+1} \sum_{j=-M}^{M} u_{ff}^{i-1}(k+j)$$  \hspace{1cm} (2)$$

where $k$ is the time index, $\gamma$ is the learning gain and $M$ is the length index of zero phase filter. Some guidelines for the design of parameters $\gamma$ and $M$ can be found in [9].

![FIGURE 3. BLOCK DIAGRAM OF ILC VIA ZERO PHASE FILTERING WITH FEEDBACK CONTROLLER](image)

**Cross-Coupled Control (CCC)**

Cross-coupled control is a special type of multi input multi output (MIMO) control which aims to decrease the contour error. Block diagram of this control scheme is given in Fig. 4. In the block diagram, $C_i$ and $C_y$ are coupling gains whereas $e_i$, $e_v$, $e_r$ are contour error, x-axis tracking error and y-axis tracking error respectively. As can be observed form Fig. 4, contour error is obtained through the equation

$$e = -C_i e_i + C_y e_r$$  \hspace{1cm} (3)$$

Although CCC is first introduced with constant gains in [14], the term CCC is generally used for CCC with variable coupling gains as proposed in [13]. For a nonlinear contour, calculation of these coupling gains is very complicated. Therefore, some contour error approximations are needed to simplify the coupling gain computation. For this purpose, Koren [13] proposed circular contour assumption. Then, Yeh and Hsu [18] presented contour error vector approach. The next two parts will briefly describe these approaches.

**Circular Contour Assumption.** In this approach any arbitrary contour is separated into parts with radius of curvature $\rho$ and these parts are approximated by circles. Since contour error for a circular contour is the difference between the distance from the actual position to the center of the circle and radius of the circle, contour error for an arbitrary contour can be written as

$$e = \sqrt{(x-x_0)^2 + (y-y_0)^2} - \rho$$  \hspace{1cm} (4)$$

where $(x_0, y_0)$ and $(x, y)$ denote center of the curvature and actual position, respectively. Expressing the actual position with respect to reference position and axial tracking errors $(e_x, e_y)$ and using Taylor expansion, approximated contour error becomes

$$e = (\cos \theta + \frac{e_x}{2\rho}) e_y - (\sin \theta - \frac{e_y}{2\rho}) e_x$$  \hspace{1cm} (5)$$

where $\theta$ is traversal angle of motion. In Eq. (5), $\rho$ becomes infinity for linear contours.

**Contouring Error Vector Approach.** Contour error vector approach can be explained through the geometrical relations in the multi-axis motion control system given in Fig. 5. In the figure, $\hat{e}$ is tracking error vector, $\hat{\epsilon}$ is estimated contour error vector, $\epsilon$ is contour error vector, $\hat{\epsilon}$ is contour error vector, $\epsilon$ is reference position. In this approach, contouring error $\epsilon$ is defined as the vector from the actual position to the nearest point on the line that passes through the reference position tangentially with direction $\theta$ [18]. This approach estimates contour error vector very closely when tracking error is small enough. Looking at Fig. 5, $\hat{\epsilon}$ is equal to $(\hat{\epsilon}, \vec{n})$ where $(\vec{n}, \vec{r})$ is inner product operator. Hence, relation between $\hat{\epsilon}$ and $\epsilon$ can be obtained using inner product. Furthermore, the contour error is calculated as $|\epsilon| = \sum C_i e_i \vec{n}$ where $C_i$ is coupling gain and $e_i$ is the corresponding axial tracking error. Considering these two representations of estimated contour error vector, cross coupling gains $(C_{x}, C_{y}, C_{z}, \ldots)$ in terms of normalized normal vector $(\vec{n} = [n_x, n_y, n_z, \ldots])$ are found as $C_i = n_i (i=x, y, z, \ldots)$. 

![FIGURE 4. BLOCK DIAGRAM OF CCC](image)
Although two different approaches give similar results in terms of contouring accuracy, contour error vector method has several advantages over the circular contour assumption. Firstly, it is computationally more efficient. Moreover, with contour error approach, coupling gains can be computed easier for an arbitrary contour. Also, implementation of circular contour approach to a multi-axis system is difficult [18].

The Improved Method

The presented work is a part of project that aims to design a controller for a three-axis positioning system with nanometer level tracking and contouring performance. The three-axis positioning system is designed such that three modular single-axis stages will be assembled on top of each other to build it. As a logical step to validate our multi-axis modular control approach, a two-axis positioning system has been assembled as shown in Fig 1. This paper focuses on real time control of two-axis system; however the feasibility study of three-axis positioning system is given to illustrate the expected results in the 3 axis system currently under development. The control system is intended to be modular considering being able to interchange the stages without changing the control system. For modularity concerns, ILC is chosen for improving tracking performance since controller structure does not change with changes in plant model structure and parameters. Moreover, contouring error vector method chosen to be used with CCC since it is computationally more efficient. As mentioned before, encoders of the positioning system have been interpolated to achieve nanometer resolution. This procedure is accomplished without any extra hardware. Due to this fact, there is a trade of between resolution of the encoders and the computational effort in the control loop. Therefore, it is aimed to minimize computational effort in the control loop to maximize encoder resolution. Using contouring error vector technique also makes the control method more suitable to implement on three-axis systems and to operate with arbitrary nonlinear contours. To sum up, a control method featuring CCC and ILC via zero phase filtering as in Fig. 6 has been developed incorporating the contouring error vector estimation technique.

SIMULATION ANALYSIS

In order to verify the performance the two-axis positioning system, simulation analysis has been provided. Moreover, feasibility study of the control method on three-axis positioning system is conducted. In the simulations, velocity profiling has been used to generate individual-axis reference trajectories. Generic s-curve method is employed for this purpose.

Simulations in Two-axis

Two-axis positioning system has been simulated with a nonlinear contour. In the proposed approach, it is straightforward to find coupling gains when the equation of the curve is known since coupling gains are just elements normal vector elements of the contour. Plant model is simulated with feedback control (FB), feedback control with cross-coupled control (FB&CCC), feedback control with iterative learning control (FB&ILC) and feedback control with cross-coupled...
TABLE 1. TWO-AXIS SYSTEM - SIMULATION RMS ERROR VALUES FOR THE NONLINEAR CONTOUR

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<tbody>
<tr>
<td>FB</td>
<td>11.30</td>
<td>111.27</td>
<td>39.04</td>
</tr>
<tr>
<td>FB &amp; CCC</td>
<td>15.42</td>
<td>110.65</td>
<td>32.36</td>
</tr>
<tr>
<td>FB &amp; ILC</td>
<td>3.47</td>
<td>2.17</td>
<td>2.73</td>
</tr>
<tr>
<td>FB &amp; CCC &amp; ILC</td>
<td>1.09</td>
<td>2.11</td>
<td>0.78</td>
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The nonlinear contour used in simulations is given in Fig. 8. In the figure, the zoomed view is taken from the part with a sharp turn that is shown with the box on the original contour because contour tracking is more difficult on sharp turns. As can be seen in zoomed view of Fig. 8, contouring performance of the system for the nonlinear contour is improved significantly when the proposed method (FB&CCC&ILC) is used instead of only feedback (FB) control.

Simulations in Three-axis

Simulations and experiments have been conducted on the two-axis system to show the effectiveness of the proposed system. However, in this work, it is also claimed that the proposed method can be easily implemented on a three-axis system. In order to demonstrate it, proposed method is simulated for three axis system. Reference contour is a 45° inclined circle with 7 micrometers radius as given in Fig. 10. As mentioned previously, coupling gains can be obtained from the normal vector of the contour. Using that approach coupling gains have been found without too much computational effort. In the zoomed view of Fig. 10, it has been observed that the proposed method has very good tracking performance compared with the feedback control. Moreover, reference contour and the resulting contour of the FB&CCC&ILC control is almost coincident. This also confirms the very small RMS tracking errors and RMS contour error observed in Tab. 2.

Simulations results of three-axis system given in Tab. 2 and Fig. 10. Looking at the results, it is observed that contour error decreases with FB&CCC whereas individual axis errors may deteriorate. Yet, when the ILC is also added to the control scheme both individual and contour errors decrease significantly. For these simulations, combined CCC and ILC gives the best contour and tracking accuracy. Moreover, it can also be observed that FB&ILC control decreases individual axis tracking errors by 63% - 85% - 63%, contour error 46%. When CCC is added to FB&ILC controls contour error decreases 72% and individual tracking errors decrease by %36 – 43% - %63. This observation confirms ILC is especially efficient in tracking control whereas CCC is especially effective for contour control.
Moreover, combining both controllers results in a controller which is effective for both tracking and contouring.

**EXPERIMENTAL RESULTS**

Velocity profiling with s-curve is used to obtain individual axis trajectories in the experimental results section. For experimental results, the same contour with same velocity profiling designed for simulations part is used. Contour tracking of the two-axis system with only feedback (FB) control and feedback control with CCC and ILC (FB&CCC&ILC) is given in Fig. 11. Looking at the zoomed view, it is obvious that presented control design improved contouring performance considerably. When Fig. 7 and Fig. 11 is compared, it should be noted that simulations and experiments give similar behavior such as deteriorated contour control just after the sharp turn. Moreover, FB&CCC&ILC system gives better contouring result than FB. Yet, in experimental results, FB&CCC&ILC design does not improve the contouring performance as much as simulation. This result is reasonable considering unmodeled system dynamics or disturbances.

**TABLE 2. THREE-AXIS SYSTEM SIMULATION - RMS ERROR VALUES FOR THE NONLINEAR CONTOUR**

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<tbody>
<tr>
<td>FB</td>
<td>235.87</td>
<td>144.26</td>
<td>235.87</td>
<td>86.07</td>
</tr>
<tr>
<td>FB &amp; CCC</td>
<td>268.06</td>
<td>177.19</td>
<td>209.68</td>
<td>59.12</td>
</tr>
<tr>
<td>FB &amp; ILC</td>
<td>33.07</td>
<td>51.44</td>
<td>33.07</td>
<td>46.29</td>
</tr>
<tr>
<td>FB &amp; CCC &amp; ILC</td>
<td>21.22</td>
<td>29.78</td>
<td>12.29</td>
<td>13.55</td>
</tr>
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</table>

*Experimental results give better contouring result than FB. However, FB&CCC&ILC design does not improve contouring performance as much as simulation. This result is reasonable considering unmodeled system dynamics or disturbances.*

**TABLE 3. TWO-AXIS SYSTEM - EXPERIMENTAL RMS ERROR VALUES FOR THE NONLINEAR CONTOUR**

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<tr>
<td>FB</td>
<td>46.84</td>
<td>113.05</td>
<td>57.08</td>
</tr>
<tr>
<td>FB &amp; CCC</td>
<td>42.06</td>
<td>94.66</td>
<td>43.49</td>
</tr>
<tr>
<td>FB &amp; ILC</td>
<td>25.81</td>
<td>79.14</td>
<td>39.33</td>
</tr>
<tr>
<td>FB &amp; CCC &amp; ILC</td>
<td>21.28</td>
<td>66.69</td>
<td>27.52</td>
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*Experiments are conducted on the system with feedback control (FB), feedback control with cross-coupled control (FB&CCC), feedback control with iterative learning control (FB&ILC) and feedback control with cross-coupled control and iterative learning control (FB&CCC&ILC). FB&ILC and FB&CCC&ILC experimental results are recorded after 20 iterations. Variation of RMS single-axis errors and RMS contour error with the different control schemes is given in Fig.12 and Tab.3. Looking at Tab. 3, it can be observed that FB&CCC system decreases contour error significantly whereas changes in axial errors are not as significant. Similarly, FB&ILC system decreases axial tracking errors more effectively than contour error as expected. Best tracking and contouring performance is obtained for FB&CCC&ILC system as for the simulation case. All axial tracking errors and contour error is improved around 50%. This improvement is higher for simulations however this is acceptable since simulations are performed for idealized systems in idealized conditions.*
CONCLUSION AND FUTURE WORK
In this paper, a new method which is computationally more efficient, more suitable for coupling gain calculations of arbitrary nonlinear contour and easier to implement on multi-axis systems is presented. Tracking and contouring performance of the method on a nonlinear contour is verified through simulations and experiments achieving nanometer level accuracy for the two-axis system. In the experiments, RMS error of x-axis, RMS error of y-axis and RMS contour error of the two-axis system is decreased to 21nm, 66nm and 27nm, respectively. Considering encoder resolution, the smallest value encoder can detect, is 25nm, resultant positioning is very accurate. Having RMS error less than the resolution means that trajectory is followed very closely and error value has been zero in some parts of the motion. Furthermore, a feasibility study of the presented method on three-axis system is conducted and results are promising. In future, real time implementation of the method on three-axis system will be practiced.

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